#### ROSE::FTTransform – A Source-to-Source Translation Framework for Exascale Fault-Tolerance Research

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#### **Outline**

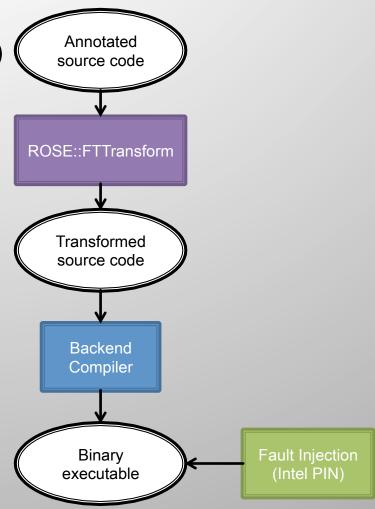
- Motivation
- Approach
- Results
- Summary
- Future work

#### **Motivation**

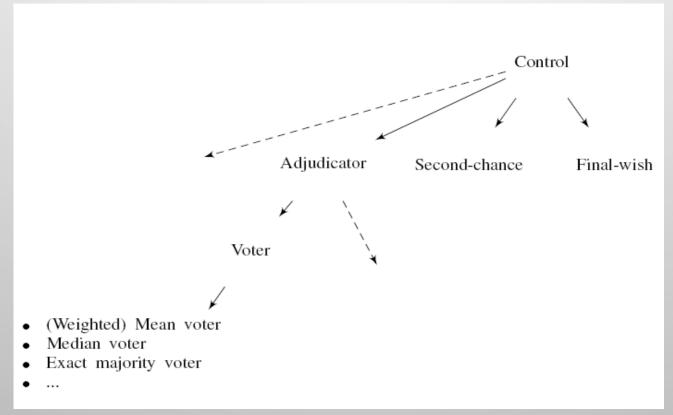
- Resilience: a big challenge for Exascale systems
  - Millions of processors/cores
  - Low-power processors/cores: power requirements
    - Increased sensitivity to internal/external events
    - Transient faults: going wrong without being noticed
  - Streamlined and simple processors
    - Cannot afford pure hardware-based resilience
- An attractive solution
  - Software-implemented hardware fault tolerance (SIHFT)
  - In house source-to-source compiler infrastructure: ROSE@LLNL

### Approach: compiler-based transformations to add resilience

- Source code annotation (pragmas)
  - What to protect
  - What to do when things go wrong
  - Can be auto inserted later on
- Source-to-source translator
  - Fault detection: N-Modular Redundancy (NMR)
  - Connect to fault-handling policies
- Backend compiler: vendor compilers or GCC
  - binary executable
- Intel PIN: fault injection



### Hierarchical structure of faulthandling policies



- Controller policies: e.g. Final-wish, Second-chance. Must be used with next-level policies
- Terminal policies: final decision about how to unify results. e.g adjudicators implementing voting strategies, mean, median, majority voting, etc.

### Source code pragmas and semantics

	Final-wish	Second-chance
Pragmas syntax	<pre>#pragma resilience FT-FW (NEXT_POLICY) y =f (x);</pre>	<pre>#pragma resilience FT-SC(NEXT_POLICY, NUM_ITER) y =f (x);</pre>
Semantics	<pre>// N-Modular Redundancy y[0] = f(x); y[N-1] = f(x);  // Tentatively pick one as the final result y = PICK_RANDOM( y[ 0 ] ,, y[N-1]); // Fault detection if ( !EQUALS( y[ 0 ] ,, y[N-1] ,y) ) { // Fault handling     NEXT_POLICY; }</pre>	<pre>for ( int rl = 0 ; ; rl ++) {     // N-Modular Redundancy     y[0] = f(x);      y[N-1] = f(x);  // Tentatively pick one as the final result     y = PICK_RANDOM( y[ 0 ] , , y[N-1]);  // No Fault is detected? if (EQUALS( y[ 0 ] , , y[N-1] ,y) )     break;  // Reaching the limit of having a second chance ? else if ( rl == NUM_ITER )     // Fault handling     NEXT_POLICY; }</pre>

# Concerns for implementing source level N-Modular Redundancy

- ROSE::FTTransform's central idea:
  - Detects/handles transient processor faults via redundant execution of critical source code statements
    - Naive implementation: duplication of N copies of computation
  - Feasible?
    - back-end compilers have Common Subexpression Elimination (CSE)
  - · Overhead?
    - Nx times slower in worst case

# Transformations: optimizer-proof code redundancy

```
/* Original Jacobi 1-D, 3-points computation kernel */
    void kernell()
      int i:
      for (i=1; i \le SIZE-1; i=i+1)
        d[i] = 0.25 * c[i-1] + 0.5 * c[i] + 0.25 * c[i+1];
8
9
    /* Transformed kernel with redundant computation */
10
    void kernel2(double *c2)
12
13
      double B_intra[3];
14
      int i;
15
      for (i=1; i < SIZE-1; i=i+1)
16
17
        /* Baseline double modular redundancy (DMR) */
        B intra[0] = 0.25*c[i-1]+0.5*c[i]+ 0.25*c[i+1];
18
19
       B intra[1]= 0.25*c2[i-1]+0.5*c2[i]+ 0.25*c2[i+1]:
20
        d[i]= B_intra[0];
        if (!equal(B_intra[0], B_intra[1], d[i])
22
23
           /* Additional N-2 redundancy and
24
               fault handling mechanism omitted here ... */
25
26
27
28
    /* call site doing pointer declaration and assignment */
30
     double *c2 = c;
     kerne12 (c2);
```

Statement to be protected

Using an extra pointer to help preserve source code redundancy

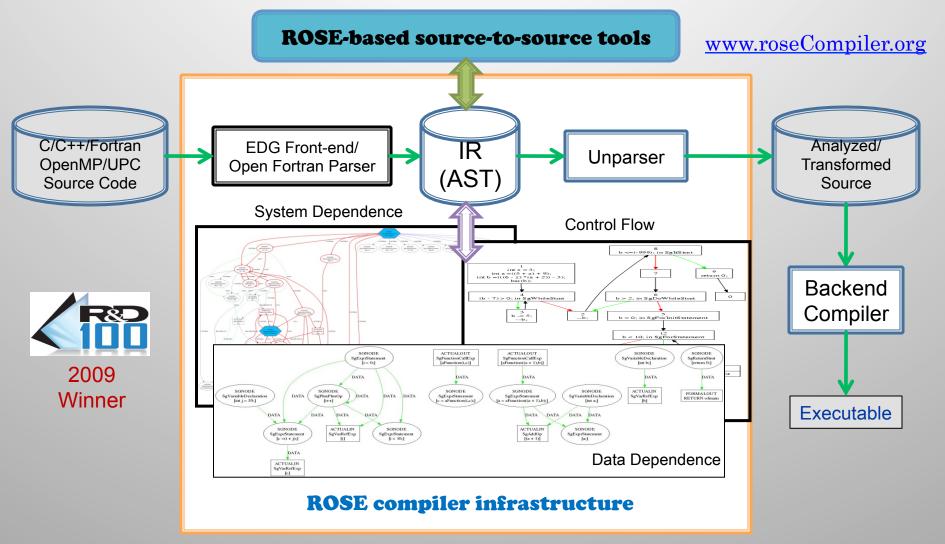
## Transformations: reducing overhead for NMR

```
/* Original Jacobi 1-D , 3-points computation kernel */
    void kernel1()
       int i:
       for (i=1; i < SIZE - 1; i=i+1)
         d[i] = 0.25 * c[i-1] + 0.5 * c[i] + 0.25 * c[i+1];
8
9
    /* Transformed kernel with redundant computation */
10
    void kernel2(double *c2)
12
13
       double B_intra[3];
14
       int i;
       for (i=1; i < SIZE - 1; i=i+1)
15
16
         /* Baseline double modular redundancy (DMR) */
17
         B intra[0] = 0.25*c[i-1]+0.5*c[i]+ 0.25*c[i+1];
18
19
         B_intra[1]= 0.25*c2[i-1]+0.5*c2[i]+ 0.25*c2[i+1];
20
         \mathbf{d}[\mathbf{i}] = \mathbf{B}_{\mathbf{i}} \mathbf{n} \mathbf{tra}[\mathbf{0}];
21
         if (!equal(B_intra[0], B_intra[1], d[i])
22
             /* Additional N-2 redundancy and
23
24
                fault handling mechanism omitted here ... */
25
26
27
28
    /* call site doing pointer declaration and assignment */
      double *c2 = c;
30
31
      kernel2(c2);
```

Statement to be protected

Relying on baseline double modular redundancy (DMR) to help reduce overhead

## Implementation of ROSE::FTTransform



# Results: necessity and effectiveness of optimizer-proof code redundancy

- Check if redundant computation can survive compiler optimizations
  - Jacobi 1-D 3-point kernel 1) original version, and 2) protected version using double module redundancy.
  - PAPI (PAPI\_FP\_INS): the number of floating point instructions for both versions
  - GCC 4.3.4, O1 to O3

Transformation Method	PAPI_FP_INS DMR/Orig. (O1)	PAPI_FP_INS DMR/Orig. (O2)	PAPI_FP_INS DMR/Orig. (O3)
Our method of using pointers	Doubled	Doubled	Doubled
Naïve Duplication	The same	The same	The same
Naïve Duplication buried within a basic block	The same	The same	The same

#### Results: performance overhead

- Performance overhead: DMR
  - Also good approximation for general NMR, excluding overhead from the incidental N-2 redundancy and faulthandling mechanism
  - Experimental environment
    - 4-core AMD Opteron: L1 data: 64K, L2: 512K, L3 6M, 129GB Memory
    - 64-bit SUSE Enterprise 11.1, GCC 4.3.4 (-03)
  - Benchmarks:
    - three versions of Jacobi : 1D 1-point, 1D 3-point, and 2D 5-point
    - Livermore loops\*
  - Explore impact of latencies of the original codes (Jacobi):
    - Data set size: arrays fitting into cache or not
    - Iteration strides: 1 vs. 8
    - Element sizes: single vs. double precision



#### Results (cont.) — overhead

#### Jacobi kernel:

- Overhead: 0% to 30%
- Minimum overhead
  - Stride=8
  - Array size 16Kx16K
  - Double precision
- The more original latency, the less overhead of added redundancy

	1-D 1-Point	1-D 3-Point	2-D 5-Point				
Iteration stride = 1							
Array	Array size: 1 million for 1-D, 4096x4096 for 2-D						
float	17.33%	29.91%	(30.19%)				
double	27.55%	22.27%	22.60%				
Array size: 16 million for 1-D, 16Kx16K for 2-D							
float	13.87%	25.58%	25.03%				
double	17.43%	19.97%	17.37%				
Iteration stride = 8							
Array size: 1 million for 1-D, 4096x4096 for 2-D							
float	8.36%	19.12%	25.39%				
double	5.10%	6.33%	5.44%				
Array size: 16 million for 1-D, 16Kx16K for 2-D							
float	3.57%	10.30%	14.54%				
double	(0.05%)	0.80%	1.59%				

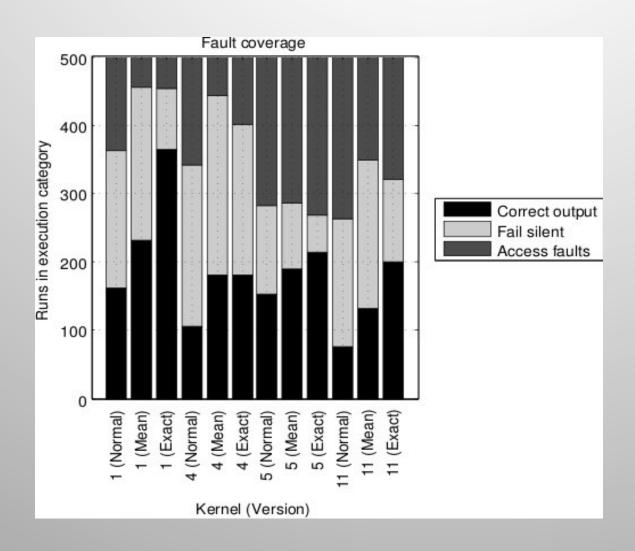
#### Livermore kernel

- Kernel 1 (Hydro fragment) 20%
- Kernel 4 (Banded linear equations) 40%
- Kernel 5 (Tri-diagonal elimination) 26%
- Kernel 11 (First sum) 2%

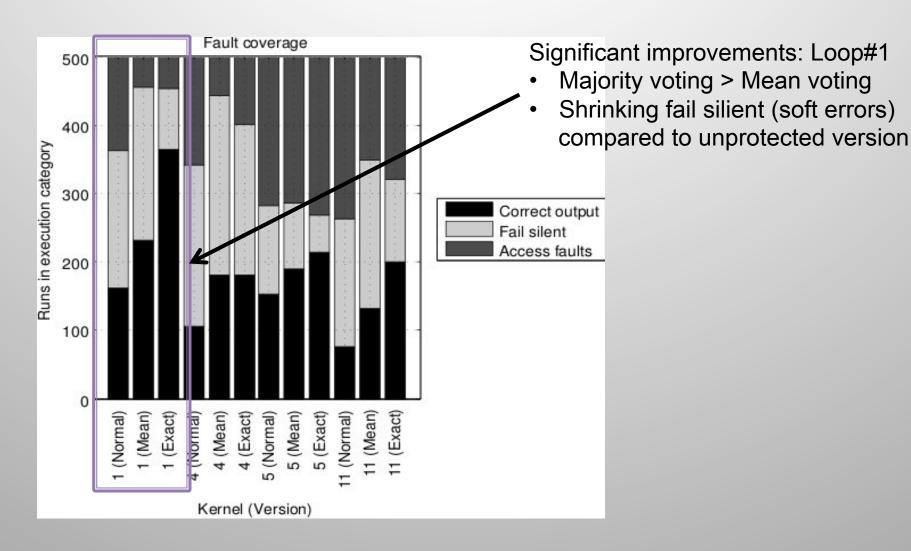
## Results: fault coverage and effectiveness

- Benchmarks: Livermore Loops suite
  - kernels #1, #4, #5, and #11
  - Three versions for each kernel:
    - Original unprotected code
    - Mean: TMR (using baseline DMR) and mean voting is added.
    - Exact: TMR (using baseline DMR) and exact majority voting is added.
- Fault injection: Intel Pin tool
  - Training runs: record correct instruction counts and output
  - Fault injection runs (500 times): flip a random bit of input general purpose/floating point register of a random instruction
- Exit condition categories the execution
  - Correct result, Access fault (invalid memory access), Fail silent, Invalid instruction, Invalid arithmetic operation

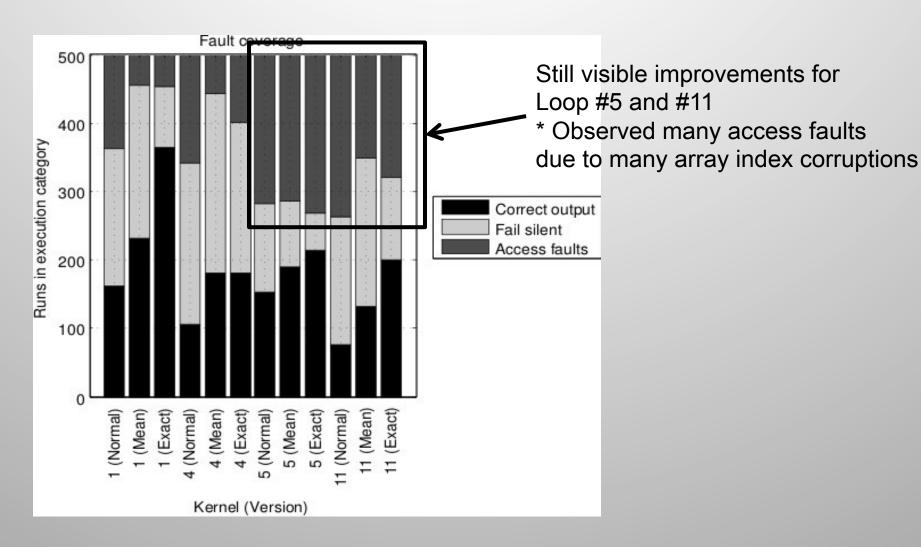
### Results (cont.) - Fault coverage



### Results (cont.) - Fault coverage



### Results (cont.) - Fault coverage



### **Summary**

- Fault handling via source-level code transformation
  - + Low cost and flexible
  - + Keeps programmer in-the-loop
  - Can't specify low-level details
- Feasibility: work with compiler optimizations.
  - CSE issues can be overcome with careful program transformation
- Overhead: N redundant executions != Nx slower
  - N-2 redundancy on demand
  - Hide overhead within latencies of original code (could be plenty for Exascale!)
- Effectiveness:
  - In both fault detection and handling

#### **Future work**

- Using multithreading for duplicated work:
  - thread vs. instruction/statement level redundancy
- Include more fault handling policies
- More ways to live with compiler optimizations (CSE)
  - transformation at binary level
- Automatically identify critical code portions for added resilience
  - Probabilistic model of operations, sensitivity to input characteristics

#### **Thank You!**

• Questions?